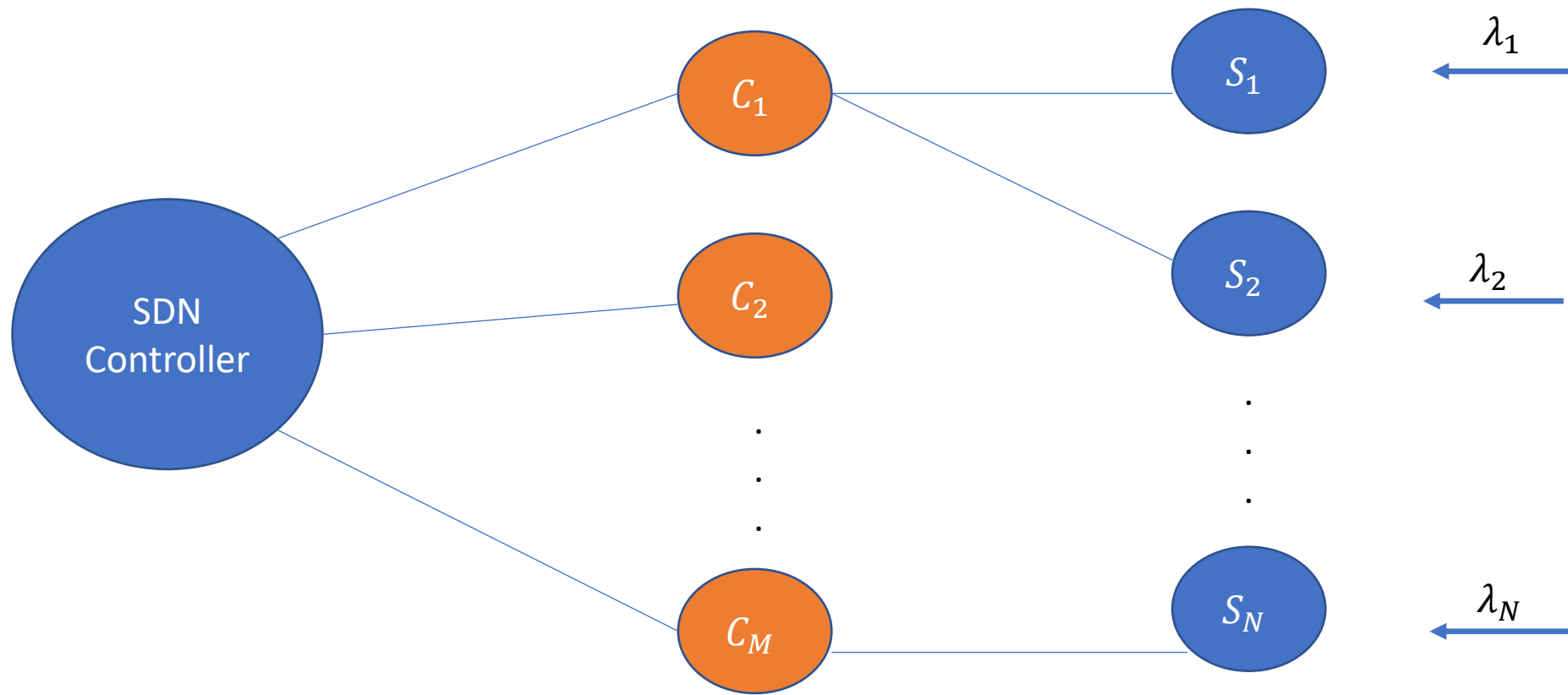


SDN Flow Control

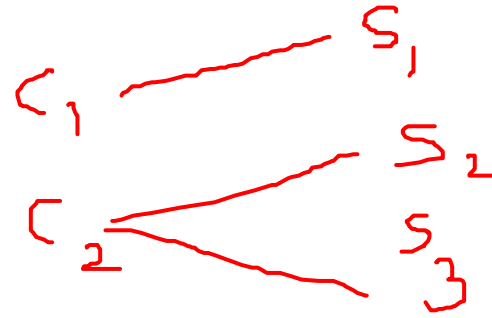


Model and Assumptions

- Whenever there is an arrival of flow, we need to take a decision
- Flow arrives at switch i as a Poisson process with parameter λ_i
- Service time of each flow is exponentially distributed with parameter μ
- State = {Number of flows in C_1, \dots , Number of flows in C_N }
- Action space for C_i = {Do nothing, Add one switch to C_i , Remove one switch from C_i }

such that all switches are accommodated in the revised allocation after the action is chosen

Model



- Reward= $r(s, a)$ = Some fairness metric after action a is chosen in state s
- Each switch has some limited capability to process flows. Hence, we can assume that the maximum number of flows supported by each switch is N_F .
- Transition probability
 - Example, say 2 controllers and 3 switches, $N_F = 2$
 - Under the action **do nothing**, $p_{ss'}(a) = \lambda_1 / (\sum_{i=1}^3 \lambda_i + 6\mu)$
if $s = (i, j)$ and $s' = (i + 1, j)$

$$\lambda_2 + \lambda_3$$

$$(i, j+1)$$

Model

- Cost: $c(s, a) = 0$ if action is do nothing
 $c(s, a) = \text{number of switch exchanges between controllers}$ else

Objective : Maximize the discounted total reward over infinite horizon

Subject to total discounted cost over infinite horizon

Formulated as constrained Markov Decision Process (CMDP)

S_{max} = Constraint on average number of switch exchanges between controller

$$\begin{aligned} & \max_{\pi \in U} \lim_{T \rightarrow \infty} \sum_{t=0}^{T-1} \alpha^t E_{\pi}[r(s_t, a_t)] \\ & \text{subject to } \lim_{T \rightarrow \infty} \sum_{t=0}^{T-1} \alpha^t E_{\pi}[c(s_t, a_t)] \leq S_{max} \end{aligned}$$

Q-learning

- $Q_{n+1}(s, a) = (1 - a(n))Q_n(s, a) + a(n)(r(s, a) - l_n c(s, a) + \alpha \max_{a'} Q_n(s', a'))$
- $l_{n+1} = \Lambda[\underline{l_n} + b(n)(S_n - S_{max})]$
- These two schemes need to be triggered whenever there is an arrival of new flow
- Take $a(n) = \frac{1}{n^{0.6}}$, $b(n) = \frac{1}{n}$
- Λ is a projection operator to keep the Lagrange multiplier l_n between $[0, L]$ for a large L

$$S_n = 1 + \alpha \cdot 1 + 0 + \alpha \cdot 1 + \dots$$